

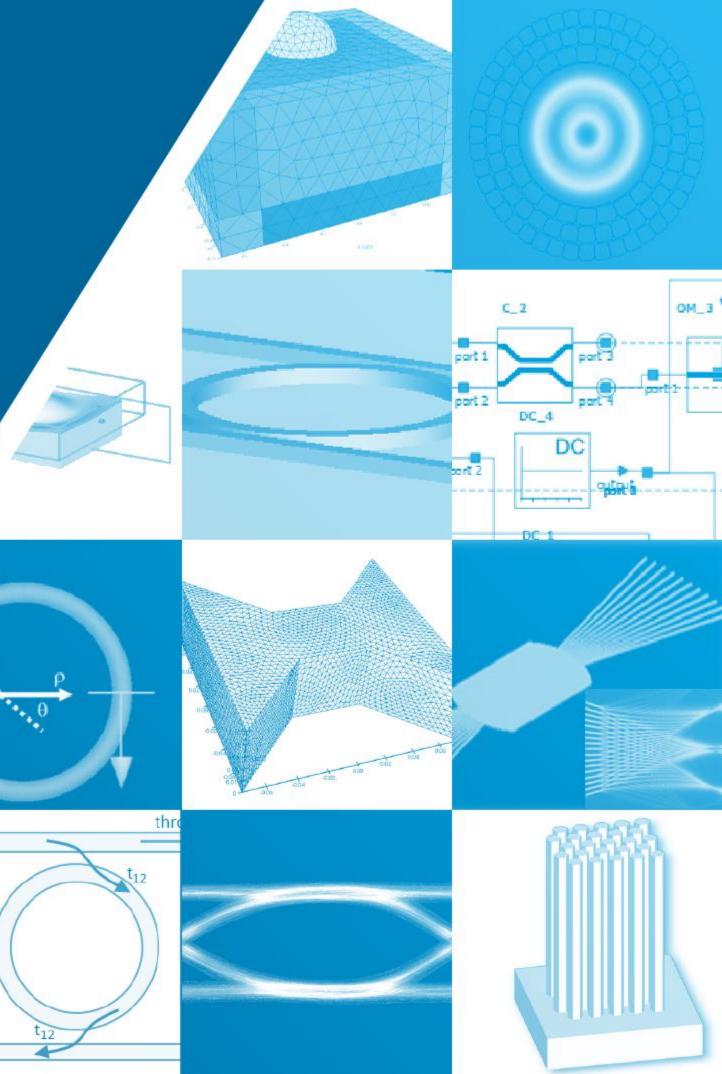
## Photonic Inverse Design using the Adjoint Method

Workshop: Optimize a splitter in one hour!

Lumerical Inc. May 2019



input



Download workshop materials at:

<u>https://kx.lumerical.com/t/lumerical-and-siepicfab-inverse-design-workshops/34471</u>

Ensure you download and install the latest version of FDTD Solutions from https://www.lumerical.com/downloads/customer/

Necessary if you want to perform layout of your final design for submission to SiEPIC

- Install Klayout (<u>http://www.klayout.de/build.html</u>)
- Install the SiEPIC Ebeam PDK by following the instructions at <u>https://github.com/lukasc-</u> ubc/SiEPIC EBeam PDK/wiki/Installation-instructions



### Lumerical's Suite of Tools

#### **DEVICE Suite Multiphysics**

FDTD Electromagnetics MODE Waveguide Component Design **DGTD** Finite Element Electromagnetics **FEEM** Eigenmode Analysis **CHARGE** Charge Transport **HEAT** Heat Transport **STACK** Optical Stack Analysis

**SYSTEM Suite** System & Circuit

**INTERCONNECT** PIC Simulation **CML Compiler** Automated CML Generation **System Element Library Extension** Laser Element Library Extension **Verilog-A Runtime API** 

Partner Interoperability

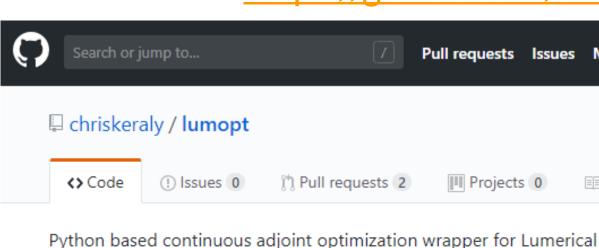
**Foundry Resources** Automation API Python Integration

#### **INTEROPERABILITY, AUTOMATION & FOUNDRY SUPPORT** Interfaces



## Lumopt: Python Based Inverse Design for Lumerical FDTD

- Lumopt: open source implementation of the adjoint method
- Collaboration with Lumerical over past year
- Targets integrated photonics
- Uses FDTD Solutions for simulation
- Uses Lumerical Automation API
- Now included with FDTD Solutions



# Adjoint shape optimization applied to electromagnetic design

#### Christopher M. Lalau-Keraly,<sup>1,\*</sup> Samarth Bhargava,<sup>1</sup> Owen D. Miller,<sup>2</sup> and Eli Yablonovitch<sup>1</sup>

<sup>1</sup>Department of Electrical Engineering and Computer Sciences, University of California at Berkeley, Berkeley, California 94720, USA <sup>2</sup>Department of Mathematics, Massachusetts Institute of Technology, Cambridge, Massachusetts 02139, USA <sup>\*</sup>chrisker@eecs.berkeley.edu

Optics Express, Vol 21, Issue 18, 2013 <u>https://www.osapublishing.org/oe/abstract.cfm?uri=oe-21-18-21693</u>

#### https://github.com/chriskeraly/lumopt

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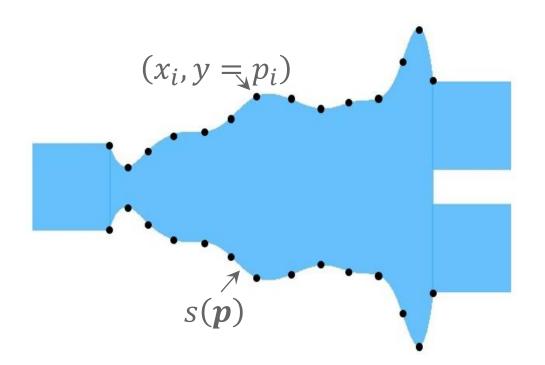
## Parametric Shape based adjoint optimization

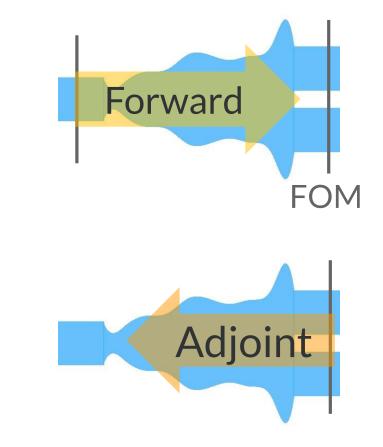
#### **Parametric shape**

- Defines design space
- **Optimization parameters**

### **Adjoint sensitivity analysis**

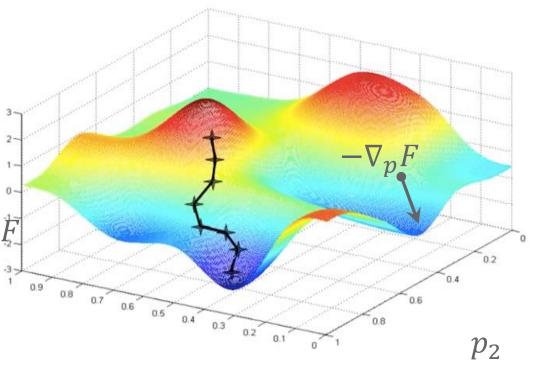
- Efficiently compute gradient
- **2 FDTD simulations**
- Independent of *#* parameters





### **Gradient based optimization** • Highly efficient optimization

Uses more physics of device



 $p_1$ 

https://hackernoon.com/gradient-descent-aynk-7cbe95a778da



## Workshop outline

### The challenge

- Constraints
- Options you can change
- The figure of merit to determine the winner

Steps:

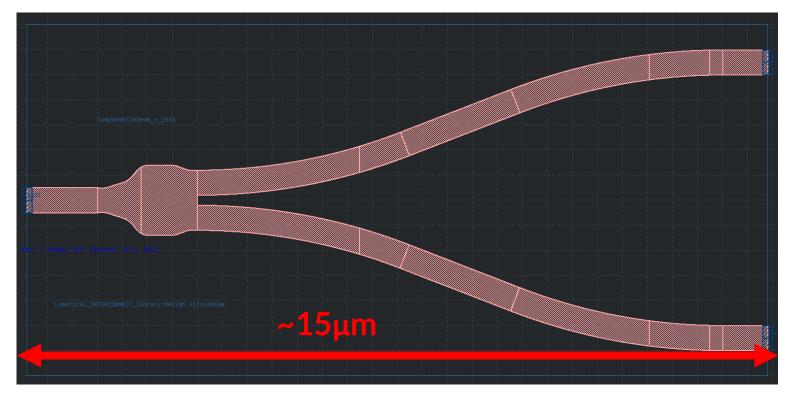
- Review constraints
- Make your design choices
- Start running optimization
- Generate 3D results and extract S parameters
- Generate full test layout by running Python script we've prepared with Klayout
- Inspect the full layout

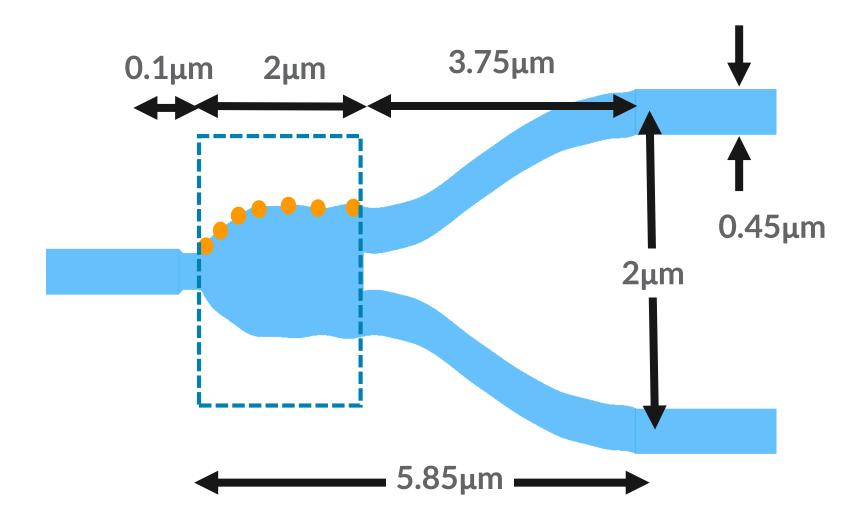




## The challenge

- Can we make a smaller splitter?
- Can we ensure broadband operation?





https://github.com/lukasc-ubc/SiEPIC\_EBeam\_PDK

A compact and low loss Y-junction for submicron silicon waveguide Yi Zhang, et al, Optics Express Vol. 21, Issue 1, pp. 1310-1316 (2013)

#### • Parametric shape with output waveguides



### **Design choices**

Number of control points for the spline = number of optimization parameters

• Currently set to 10

Spline boundary condition

• 'clamped' or 'not-a-knot' – currently 'clamped' which means derivative is 0 at boundaries

Bandwidth

Currently set to C+L band

Delta (for robust design)

- If delta==0 we do normal optimization
- If delta!=0 (see next slide)
- Currently delta = 20nm

Note that adjoint optimization is a steepest descent method

 Adding more constraints can actually smoothen the FOM landscape and allow you to avoid local minima BUT too many constraints will reduce the FOM

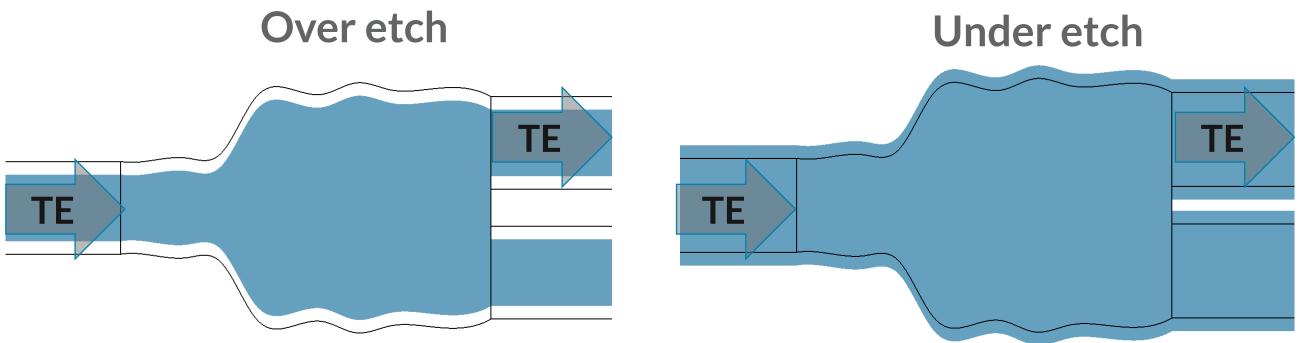


### What does delta do?

If delta is not zero, we do co-optimization

- "Over etch" slightly smaller than nominal (-delta)
- "Under etch" slightly larger than nominal (+delta)

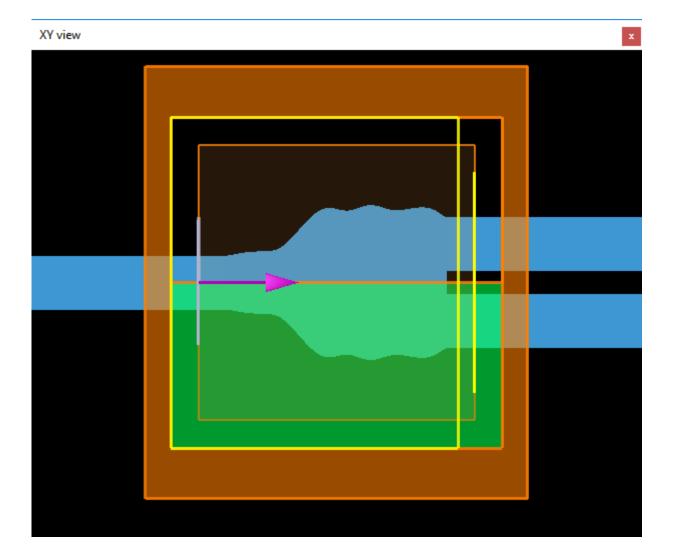
FOM = sum of FOMs from both simulations

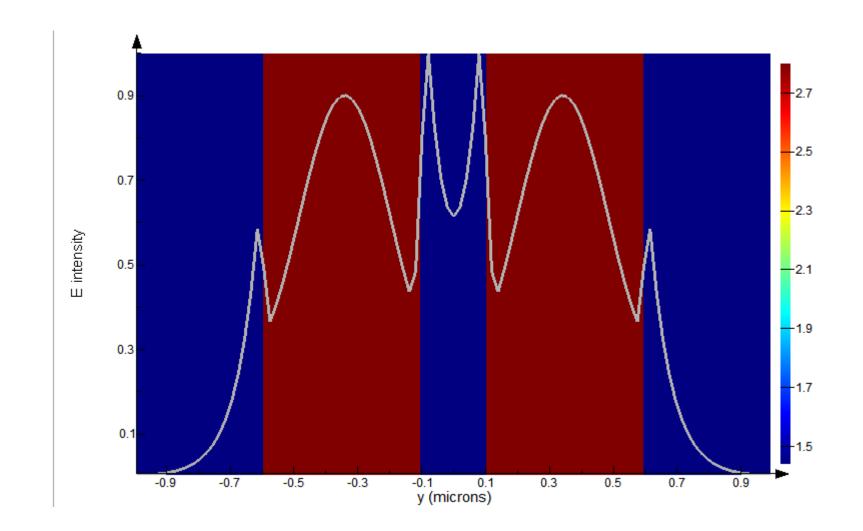




### What FOM are we optimizing?

#### FOM is the power transmitted to the symmetric waveguide mode







From 3D simulation including bent waveguide arms we extract the S matrix for the nominal design (no overetch/under-etch)

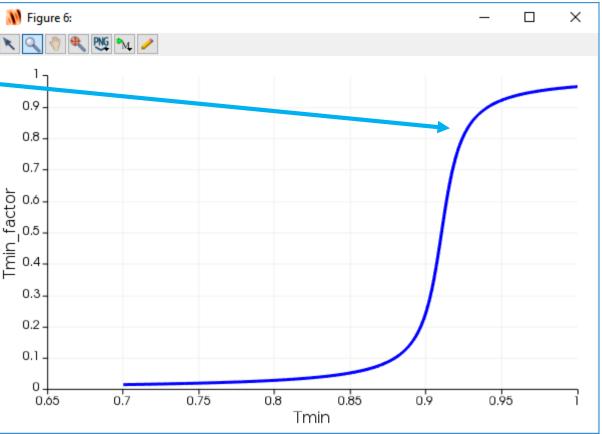
The best design has the highest **design\_score** where:

- design\_score = Tmin\_factor \* bandwidth\_factor
- Tmin\_factor = atan(100\*(Tmin-0.91))/pi+0.5
- bandwidth\_factor = bandwidth/100nm
- Tmin is the minimum transmission over the bandwidth

Figure 6: 0.9 0.8 0.7 min\_factor .5.0 .4.0 0.3 0.2 0.1 0.65

There is a big cost to allowing your minimum transmission to fall below about 0.3 dB !







## **Running the examples in FDTD Solutions**

#### Method 1: Easy Method 2: Power user 1. Open FDTD Solutions **1.** Install Python, SciPy, Jupyter 2. Open .py file in FDTD script editor 3. Press run script 3. Open \*.ipynb in Jupyter

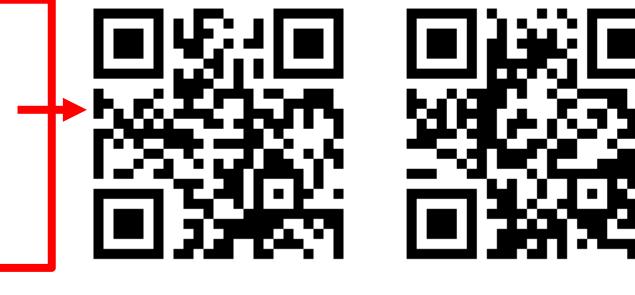
Uses Python and Lumopt provided with FDTD **Solutions** 

Requires FDTD Solutions 2019a R6 (8.21.1933) Software installer available on USB drive or web Windows: http://lumeri.ca/zeqxy MacOS: http://lumeri.ca/7d952

2. Configure Python path to Lumerical modules in <FDTD folder>/api/python

Windows

Mac



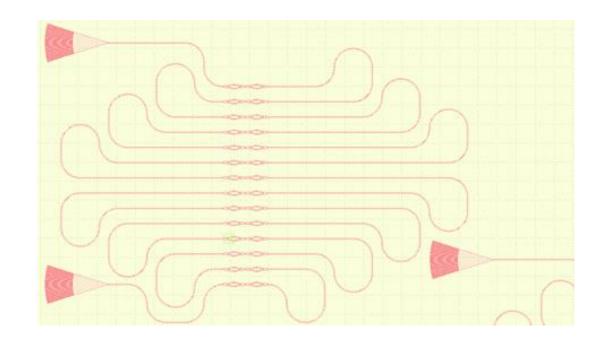


### Making the full test layout

We provide a scripts called make\_test\_layout.lsf and make\_test\_layout.py Run by

- Open make\_test\_layout.lsf and press run
  - You may need to edit the script depending on your Klayout installation folder
- Power users
  - Opening a command prompt and change to the directory where you are working
  - Run <KLayout install folder >\klayout\_app.exe -r make\_test\_layout.py

Inspect with KLayout





## Submit your design

See <u>https://www.linkedin.com/pulse/openebl-fabrication-test-passive-silicon-photonic-lukas-chrostowski?trk=portfolio\_article-card\_title\_</u>

Key points

- Submission:
  - Filename openEBL\_USERNAME.gds "openEBL" is case sensitive; replace USERNAME with your name. Append "\_A", "\_B", etc., if submitting multiple layouts.
  - Top cell openEBL\_USERNAME
  - Upload your GDS layout file here: https://bit.ly/2M4hPPT The secret is the material that the waveguides are made of (hint: chemical element with atomic number 14)
- Merge verification •
  - Download the following files, to check that your design is here and correct. There may be a 1-5 minute delay between submission and merge.
    - Merged GDS file: <u>http://upload.siepic.ubc.ca/openEBL/openEBL.gds</u>
    - Log file: <u>http://upload.siepic.ubc.ca/openEBL/openEBL.txt</u>
    - Automated measurement coordinate list: <u>http://upload.siepic.ubc.ca/openEBL/openEBL coords.txt</u>
- Fabrication results: •
  - Will be shared via Dropbox.com: <u>http://bit.ly/1fiQe7l</u> and https://www.dropbox.com/sh/030suvs0vk4pw66/AABDah85xHeMPgyARms73pCda?dl=0. To download a particular folder, replace the =0 with =1.

Disclaimer: Nothing is guaranteed. Provided as-is, best effort. The designs submitted here are publicly accessible. For educational purposes. Space limited; first-come first-served.





#### Lukas Chrostowski's edX course!



Courses - How It Works - Schools & Partners About -



and data analysis.



#### About this course

This short course teaches students and industry professionals how to design integrated optical devices and circuits, using a hands-on approach with commercial tools. We will fabricate your designs using a state-of-the-art (\$5M) silicon photonic rapid-prototyping 100 keV electron-beam lithography facility. We will measure your designs using an automated optical probe station and provide you the

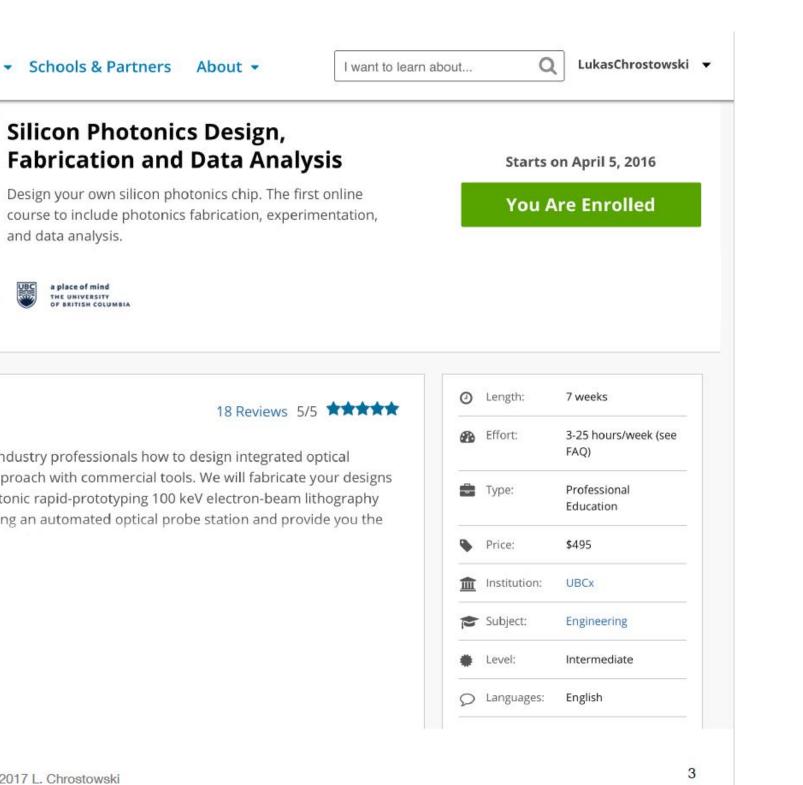
#### See more

#### What you'll learn

- · Optical modelling tools
- Mask layout tools
- · Design of optical devices and circuits
- Data analysis techniques



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